


```

SparkSession available as 'spark'.
>>> from pyspark.sql import functions as F
>>> from pyspark.sql.types import *
>>> kafka_brokers = "bigdataanalytics-worker-3:6667"
>>> raw_data = spark.readStream. \
...     format("kafka"). \
...     option("kafka.bootstrap.servers", kafka_brokers). \
...     option("subscribe", "lesson_5_iris"). \
...     option("startingOffsets", "earliest"). \
...     option("maxOffsetsPerTrigger", "5"). \
...     load()
>>> schema = StructType() \
...     .add("sepalLength", FloatType()) \
...     .add("sepalWidth", FloatType()) \
...     .add("petalLength", FloatType()) \
...     .add("petalWidth", FloatType()) \
...     .add("species", StringType())
>>>
>>> extended_iris = raw_data \
...     .select(F.from_json(F.col("value").cast("String"), schema).alias("value"), "offset") \
...     .select("value.*", "offset") \
...     .withColumn("receive_time", F.current_timestamp())
>>> extended_iris.printSchema()
root
|-- sepalLength: float (nullable = true)
|-- sepalWidth: float (nullable = true)
|-- petalLength: float (nullable = true)
|-- petalWidth: float (nullable = true)
|-- species: string (nullable = true)
|-- offset: long (nullable = true)
|-- receive_time: timestamp (nullable = false)

```

```
>>> stream = console_output(extended_iris,5)
22/02/05 10:53:32 WARN shortcircuit.DomainSocketFactory: The short-circuit local reads feature cannot be used
```

```
-----
Batch: 0
-----
```

sepalLength	sepalWidth	petalLength	petalWidth	species	offset	receive_time
4.9	3.0	1.4	0.2	setosa	0	2022-02-05 10:53:36.826
null	null	null	null	null	0	2022-02-05 10:53:36.826
5.1	3.5	1.4	0.2	setosa	0	2022-02-05 10:53:36.826

```
22/02/05 10:53:38 WARN streaming.ProcessingTimeExecutor: Current batch is falling behind. The trigger interval
```

```
-----
Batch: 1
-----
```

sepalLength	sepalWidth	petalLength	petalWidth	species	offset	receive_time
5.0	3.6	1.4	0.2	setosa	1	2022-02-05 10:53:38.839
4.7	3.2	1.3	0.2	setosa	1	2022-02-05 10:53:38.839
4.6	3.1	1.5	0.2	setosa	1	2022-02-05 10:53:38.839

```
-----
Batch: 2
-----
```

sepalLength	sepalWidth	petalLength	petalWidth	species	offset	receive_time
5.0	3.4	1.5	0.2	setosa	2	2022-02-05 10:53:40.007
5.4	3.9	1.7	0.4	setosa	2	2022-02-05 10:53:40.007
4.6	3.4	1.4	0.3	setosa	2	2022-02-05 10:53:40.007

```
[student559_10@bigdataanalytics-worker-3 bin]$ hdfs dfs -ls
Found 5 items
drwx----- - student559_10 student559_10          0 2022-02-01 06:00 .Trash
drwxr-xr-x - student559_10 student559_10          0 2022-01-28 23:15 .sparkStaging
drwxr-xr-x - student559_10 student559_10          0 2022-02-05 10:53 checkpoints
drwxr-xr-x - student559_10 student559_10          0 2022-01-28 14:11 for_stream
drwxr-xr-x - student559_10 student559_10          0 2022-01-31 10:04 shadrin_iris_kafka_checkpoint
[student559_10@bigdataanalytics-worker-3 bin]$ hdfs dfs -du -h checkpoints/duplicates_console_chk
87      174      checkpoints/duplicates_console_chk/commits
45       90      checkpoints/duplicates_console_chk/metadata
1.3 K   2.6 K    checkpoints/duplicates_console_chk/offsets
41       82      checkpoints/duplicates_console_chk/sources
[student559_10@bigdataanalytics-worker-3 bin]$
```

```
>>> deduplicated_iris = waterwarked_iris.drop_duplicates(["species", "receive_time"])
>>> stream = console_output(deduplicated_iris, 20)
```

Batch: 0

sepalLength	sepalWidth	petalLength	petalWidth	species	offset	receive_time
4.9	3.0	1.4	0.2	setosa	0	2022-02-05 10:55:07.272
null	null	null	null	null	0	2022-02-05 10:55:07.272

Batch: 1

sepalLength	sepalWidth	petalLength	petalWidth	species	offset	receive_time
5.0	3.6	1.4	0.2	setosa	1	2022-02-05 10:55:20.005

Batch: 2

sepalLength	sepalWidth	petalLength	petalWidth	species	offset	receive_time
5.0	3.4	1.5	0.2	setosa	2	2022-02-05 10:55:40.004

Batch: 3

sepalLength	sepalWidth	petalLength	petalWidth	species	offset	receive_time
5.4	3.7	1.5	0.2	setosa	3	2022-02-05 10:56:00.005


```

of starting query.
22/02/05 10:57:16 WARN state.HDFSBackedStateStoreProvider: The state for version 4 doesn't exist in
of starting query.
22/02/05 10:57:16 WARN state.HDFSBackedStateStoreProvider: The state for version 4 doesn't exist in
of starting query.
[Stage 14:=====> (191 + 1) / 200]22/02/05 10:57:16 WARN state.HDFSBackedStateStoreProvider: The state for version 4 doesn't exist in
ot file and delta files if needed...Note that this is normal for the first batch of starting query.
22/02/05 10:57:16 WARN state.HDFSBackedStateStoreProvider: The state for version 4 doesn't exist in
of starting query.
22/02/05 10:57:16 WARN state.HDFSBackedStateStoreProvider: The state for version 4 doesn't exist in
of starting query.
22/02/05 10:57:16 WARN state.HDFSBackedStateStoreProvider: The state for version 4 doesn't exist in
of starting query.
22/02/05 10:57:16 WARN state.HDFSBackedStateStoreProvider: The state for version 4 doesn't exist in
of starting query.
22/02/05 10:57:16 WARN state.HDFSBackedStateStoreProvider: The state for version 4 doesn't exist in
of starting query.
22/02/05 10:57:16 WARN state.HDFSBackedStateStoreProvider: The state for version 4 doesn't exist in
of starting query.
[Stage 14:=====>(198 + 1) / 200]22/02/05 10:57:16 WARN state.HDFSBackedStateStoreProvider: The state for version 4 doesn't exist in
ot file and delta files if needed...Note that this is normal for the first batch of starting query.
-----
Batch: 4
-----
+-----+-----+-----+-----+-----+-----+-----+
|sepalLength|sepalWidth|petalLength|petalWidth|species|offset|receive_time|
+-----+-----+-----+-----+-----+-----+-----+
|4.8        |3.4        |1.6        |0.2        |setosa |4       |2022-02-05 10:56:48.266|
+-----+-----+-----+-----+-----+-----+-----+

-----
Batch: 5
-----
+-----+-----+-----+-----+-----+-----+-----+
|sepalLength|sepalWidth|petalLength|petalWidth|species|offset|receive_time|
+-----+-----+-----+-----+-----+-----+-----+
|5.4        |3.9        |1.3        |0.4        |setosa |5       |2022-02-05 10:57:19.456|
+-----+-----+-----+-----+-----+-----+-----+

-----
Batch: 6
-----
+-----+-----+-----+-----+-----+-----+-----+
|sepalLength|sepalWidth|petalLength|petalWidth|species|offset|receive_time|
+-----+-----+-----+-----+-----+-----+-----+
|5.1        |3.8        |1.5        |0.3        |setosa |6       |2022-02-05 10:57:23.238|
+-----+-----+-----+-----+-----+-----+-----+

```

```
>>> windowed_iris = extended_iris.withColumn("window_time", F.window(F.col("receive_time"), "2 minutes"))
>>>
>>> windowed_iris.printSchema()
root
 |-- sepalLength: float (nullable = true)
 |-- sepalWidth: float (nullable = true)
 |-- petalLength: float (nullable = true)
 |-- petalWidth: float (nullable = true)
 |-- species: string (nullable = true)
 |-- offset: long (nullable = true)
 |-- receive_time: timestamp (nullable = false)
 |-- window_time: struct (nullable = false)
 |     |-- start: timestamp (nullable = true)
 |     |-- end: timestamp (nullable = true)
>>>
>>> waterwarked_windowed_iris = windowed_iris.withWatermark("window_time", "2 minutes")
>>> deduplicated_windowed_iris = waterwarked_windowed_iris \
...     .drop_duplicates(["species", "window_time"])
>>> stream = console_output(deduplicated_windowed_iris , 5)
```



```
|sepalLength|sepalWidth|petalLength|petalWidth|species|offset|receive_time|window_time|
+-----+-----+-----+-----+-----+-----+-----+-----+
+-----+-----+-----+-----+-----+-----+-----+-----+
```

Batch: 12

```
+-----+-----+-----+-----+-----+-----+-----+-----+
|sepalLength|sepalWidth|petalLength|petalWidth|species|offset|receive_time|window_time|
+-----+-----+-----+-----+-----+-----+-----+-----+
|4.9|3.6|1.4|0.1|setosa|12|2022-02-05 11:00:00.003|[2022-02-05 11:00:00, 2022-02-05 11:02:00]|
+-----+-----+-----+-----+-----+-----+-----+-----+
```

22/02/05 11:00:06 **WARN** streaming.ProcessingTimeExecutor: Current batch is falling behind. The trigger interval is 5000 milliseconds, but spent 6027 m

Batch: 13

```
+-----+-----+-----+-----+-----+-----+-----+-----+
|sepalLength|sepalWidth|petalLength|petalWidth|species|offset|receive_time|window_time|
+-----+-----+-----+-----+-----+-----+-----+-----+
+-----+-----+-----+-----+-----+-----+-----+-----+
```

Batch: 14

```
+-----+-----+-----+-----+-----+-----+-----+-----+
|sepalLength|sepalWidth|petalLength|petalWidth|species|offset|receive_time|window_time|
+-----+-----+-----+-----+-----+-----+-----+-----+
+-----+-----+-----+-----+-----+-----+-----+-----+
```

Batch: 15

```
+-----+-----+-----+-----+-----+-----+-----+-----+
|sepalLength|sepalWidth|petalLength|petalWidth|species|offset|receive_time|window_time|
+-----+-----+-----+-----+-----+-----+-----+-----+
+-----+-----+-----+-----+-----+-----+-----+-----+
```

22/02/05 11:00:23 **WARN** streaming.ProcessingTimeExecutor: Current batch is falling behind. The trigger interval is 5000 milliseconds, but spent 8043 m

Batch: 16

```
+-----+-----+-----+-----+-----+-----+-----+-----+
|sepalLength|sepalWidth|petalLength|petalWidth|species|offset|receive_time|window_time|
+-----+-----+-----+-----+-----+-----+-----+-----+
+-----+-----+-----+-----+-----+-----+-----+-----+
```

22/02/05 11:00:28 **WARN** streaming.ProcessingTimeExecutor: Current batch is falling behind. The trigger interval is 5000 milliseconds, but spent 5079 m

Batch: 17

```
+-----+-----+-----+-----+-----+-----+-----+-----+
|sepalLength|sepalWidth|petalLength|petalWidth|species|offset|receive_time|window_time|
+-----+-----+-----+-----+-----+-----+-----+-----+
|6.9|3.1|4.9|1.5|versicolor|17|2022-02-05 11:00:28.257|[2022-02-05 11:00:00, 2022-02-05 11:02:00]|
+-----+-----+-----+-----+-----+-----+-----+-----+
```

```
>>> sliding_iris = extended_iris.withColumn("sliding_time", F.window(F.col("receive_time"), "1 minute", "30 seconds"))
>>> watermarked_sliding_iris = sliding_iris.withWatermark("sliding_time", "2 minutes")
>>> deduplicated_sliding_iris = watermarked_sliding_iris.drop_duplicates(["species", "sliding_time"])
>>> deduplicated_sliding_iris.printSchema()
root
 |-- sepalLength: float (nullable = true)
 |-- sepalWidth: float (nullable = true)
 |-- petalLength: float (nullable = true)
 |-- petalWidth: float (nullable = true)
 |-- species: string (nullable = true)
 |-- offset: long (nullable = true)
 |-- receive_time: timestamp (nullable = false)
 |-- sliding_time: struct (nullable = true)
 |   |-- start: timestamp (nullable = true)
 |   |-- end: timestamp (nullable = true)
>>> █
```

```
>>> stream = console_output(deduplicated_sliding_iris , 20)
```

```
-----  
Batch: 0  
-----
```

sepalLength	sepalWidth	petalLength	petalWidth	species	offset	receive_time	sliding_time
null	null	null	null	null	0	2022-02-05 11:02:36.797	[2022-02-05 11:02:00, 2022-02-05 11:03:00]
4.9	3.0	1.4	0.2	setosa	0	2022-02-05 11:02:36.797	[2022-02-05 11:02:00, 2022-02-05 11:03:00]
4.9	3.0	1.4	0.2	setosa	0	2022-02-05 11:02:36.797	[2022-02-05 11:02:30, 2022-02-05 11:03:30]
null	null	null	null	null	0	2022-02-05 11:02:36.797	[2022-02-05 11:02:30, 2022-02-05 11:03:30]

```
-----  
Batch: 1  
-----
```

sepalLength	sepalWidth	petalLength	petalWidth	species	offset	receive_time	sliding_time
-------------	------------	-------------	------------	---------	--------	--------------	--------------

```
-----  
Batch: 2  
-----
```

sepalLength	sepalWidth	petalLength	petalWidth	species	offset	receive_time	sliding_time
5.0	3.4	1.5	0.2	setosa	2	2022-02-05 11:03:00.004	[2022-02-05 11:03:00, 2022-02-05 11:04:00]

```
-----  
Batch: 3  
-----
```

sepalLength	sepalWidth	petalLength	petalWidth	species	offset	receive_time	sliding_time
-------------	------------	-------------	------------	---------	--------	--------------	--------------

```
stream.stop()
```

```
>>> def console_output(df, freq, out_mode):
...     return df.writeStream.format("console") \
...         .trigger(processingTime='%s seconds' % freq) \
...         .options(truncate=False) \
...         .option("checkpointLocation", "checkpoints/watermark_console_chk2") \
...         .outputMode(out_mode) \
...         .start()
...
>>> count_iris = waterwarked_windowed_iris.groupBy("window_time").count()
>>> █
```

Batch: 24

```
-----  
+-----+-----+  
|window_time|count|  
+-----+-----+  
|[2022-02-05 11:04:00, 2022-02-05 11:06:00]|3|  
+-----+-----+
```

22/02/05 11:04:40 **WARN** streaming.ProcessingTimeExecutor: Current batch is falling behind. The trigger interval is 5000 milliseconds, but spent 28854 milliseconds

Batch: 25

```
-----  
+-----+-----+  
|window_time|count|  
+-----+-----+  
|[2022-02-05 11:04:00, 2022-02-05 11:06:00]|6|  
+-----+-----+
```

22/02/05 11:04:46 **WARN** streaming.ProcessingTimeExecutor: Current batch is falling behind. The trigger interval is 5000 milliseconds, but spent 5589 milliseconds

Batch: 26

```
-----  
+-----+-----+  
|window_time|count|  
+-----+-----+  
|[2022-02-05 11:04:00, 2022-02-05 11:06:00]|9|  
+-----+-----+
```

22/02/05 11:04:51 **WARN** streaming.ProcessingTimeExecutor: Current batch is falling behind. The trigger interval is 5000 milliseconds, but spent 5331 milliseconds

Batch: 27

```
-----  
+-----+-----+  
|window_time|count|  
+-----+-----+  
|[2022-02-05 11:04:00, 2022-02-05 11:06:00]|12|  
+-----+-----+
```

22/02/05 11:04:57 **WARN** streaming.ProcessingTimeExecutor: Current batch is falling behind. The trigger interval is 5000 milliseconds, but spent 6199 milliseconds

Запустим поток с параметром complete

```
h of starting query.
-----
Batch: 28
-----
+-----+-----+
|window_time|count|
+-----+-----+
|[2022-01-31 19:00:00, 2022-01-31 19:02:00]|33|
|[2022-01-31 19:06:00, 2022-01-31 19:07:00]|9|
|[2022-02-05 11:04:00, 2022-02-05 11:06:00]|15|
|[2022-01-31 19:02:30, 2022-01-31 19:03:30]|3|
|[2022-01-31 19:05:30, 2022-01-31 19:06:30]|9|
|[2022-01-31 19:06:30, 2022-01-31 19:07:30]|3|
|[2022-01-31 19:05:00, 2022-01-31 19:06:00]|3|
|[2022-01-31 19:02:00, 2022-01-31 19:04:00]|6|
|[2022-01-31 19:02:00, 2022-01-31 19:03:00]|3|
|[2022-01-31 18:58:00, 2022-01-31 19:00:00]|18|
+-----+-----+

22/02/05 11:05:39 WARN streaming.ProcessingTimeExecutor: Current batch
-----
Batch: 29
-----
+-----+-----+
|window_time|count|
+-----+-----+
|[2022-01-31 19:00:00, 2022-01-31 19:02:00]|33|
|[2022-01-31 19:06:00, 2022-01-31 19:07:00]|9|
|[2022-02-05 11:04:00, 2022-02-05 11:06:00]|18|
|[2022-01-31 19:02:30, 2022-01-31 19:03:30]|3|
|[2022-01-31 19:05:30, 2022-01-31 19:06:30]|9|
|[2022-01-31 19:06:30, 2022-01-31 19:07:30]|3|
|[2022-01-31 19:05:00, 2022-01-31 19:06:00]|3|
|[2022-01-31 19:02:00, 2022-01-31 19:04:00]|6|
|[2022-01-31 19:02:00, 2022-01-31 19:03:00]|3|
|[2022-01-31 18:58:00, 2022-01-31 19:00:00]|18|
+-----+-----+
```


Запустим поток с параметром append (не работает с агрегирующей функцией count) → пропустим

Запустим sliding

```
not file and delta files if needed...NOTE that this is normal for the
-----
Batch: 43
-----
+-----+-----+
|sliding_time|count|
+-----+-----+
|[2022-02-05 11:11:30, 2022-02-05 11:12:30]|3|
|[2022-02-05 11:12:00, 2022-02-05 11:13:00]|3|
+-----+-----+

Batch: 44
-----
+-----+-----+
|sliding_time|count|
+-----+-----+
|[2022-02-05 11:12:30, 2022-02-05 11:13:30]|3|
|[2022-02-05 11:13:00, 2022-02-05 11:14:00]|3|
+-----+-----+

Batch: 45
-----
+-----+-----+
|sliding_time|count|
+-----+-----+
|[2022-02-05 11:12:30, 2022-02-05 11:13:30]|6|
|[2022-02-05 11:13:00, 2022-02-05 11:14:00]|6|
+-----+-----+
```